## DTM and LDA

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04/11/2021

## R Markdown

This is an R Markdown document. Markdown is a simple formatting syntax for authoring HTML, PDF, and MS Word documents. For more details on using R Markdown see http://rmarkdown.rstudio.com.

When you click the **Knit** button a document will be generated that includes both content as well as the output of any embedded R code chunks within the document. You can embed an R code chunk like this:

## summary(cars)

```
##
        speed
                         dist
##
            : 4.0
                            : 2.00
    Min.
                    Min.
    1st Qu.:12.0
                    1st Qu.: 26.00
##
    Median:15.0
                    Median : 36.00
##
    Mean
            :15.4
                    Mean
                            : 42.98
    3rd Qu.:19.0
                    3rd Qu.: 56.00
##
            :25.0
                            :120.00
    Max.
                    Max.
```

## **Including Plots**

You can also embed plots, for example:



Note that the echo = FALSE parameter was added to the code chunk to prevent printing of the R code that generated the plot.

#{r setup, include=FALSE} #knitr::opts\_chunk\$set(echo = TRUE)

```
#install.packages("lexicon", dependencies = TRUE)
#install.packages("tm", dependencies = TRUE)
#install.packages("RWeka", dependencies = TRUE)
#install.packages("textstem", dependencies = TRUE)
#install.packages("textclean", dependencies = TRUE)
#install.packages("dplyr")
#install.packages("quanteda")
#install.packages("textstem")
#install.packages("text2vec")
#install.packages("namespace")
#install.packages("stopwords")
#install.packages("pairheatmap")
#install.packages("LDAvis")
#install.packages("servr")
#Loading the packages to the current workspace
lstPackages <- c('lexicon','tm','RWeka','textstem','textclean')</pre>
lapply(lstPackages, library, character.only = TRUE)
```

## Loading required package: NLP

```
## Loading required package: koRpus.lang.en
## Loading required package: koRpus
## Loading required package: sylly
## For information on available language packages for 'koRpus', run
##
##
     available.koRpus.lang()
##
## and see ?install.koRpus.lang()
## Attaching package: 'koRpus'
## The following object is masked from 'package:tm':
##
##
       readTagged
## [[1]]
## [1] "lexicon"
                   "stats"
                                "graphics" "grDevices" "utils"
                                                                     "datasets"
## [7] "methods"
                   "base"
## [[2]]
## [1] "tm"
                    "NLP"
                                 "lexicon"
                                             "stats"
                                                          "graphics"
                                                                      "grDevices"
## [7] "utils"
                    "datasets"
                                 "methods"
                                             "base"
##
## [[3]]
                                 "NLP"
##
  [1] "RWeka"
                    "tm"
                                             "lexicon"
                                                          "stats"
                                                                      "graphics"
##
   [7] "grDevices" "utils"
                                 "datasets"
                                             "methods"
                                                          "base"
##
## [[4]]
##
  [1] "textstem"
                         "koRpus.lang.en" "koRpus"
                                                             "sylly"
                         "tm"
  [5] "RWeka"
                                           "NLP"
                                                             "lexicon"
## [9] "stats"
                         "graphics"
                                                             "utils"
                                           "grDevices"
## [13] "datasets"
                         "methods"
                                           "base"
##
## [[5]]
## [1] "textclean"
                         "textstem"
                                           "koRpus.lang.en" "koRpus"
## [5] "sylly"
                         "RWeka"
                                           "tm"
                                                             "NLP"
                         "stats"
## [9] "lexicon"
                                           "graphics"
                                                             "grDevices"
## [13] "utils"
                         "datasets"
                                           "methods"
                                                             "base"
library(quanteda)
## Package version: 3.1.0
## Unicode version: 13.0
## ICU version: 69.1
## Parallel computing: 4 of 4 threads used.
## See https://quanteda.io for tutorials and examples.
```

```
##
## Attaching package: 'quanteda'
## The following objects are masked from 'package:koRpus':
##
##
       tokens, types
## The following object is masked from 'package:tm':
##
##
       stopwords
## The following objects are masked from 'package:NLP':
##
##
       meta, meta<-
library(stringr)
library(dplyr)
## Attaching package: 'dplyr'
## The following objects are masked from 'package:stats':
##
       filter, lag
##
## The following objects are masked from 'package:base':
##
       intersect, setdiff, setequal, union
##
library(wordcloud)
## Loading required package: RColorBrewer
library(textstem)
library(pairheatmap)
## Loading required package: grid
library(LDAvis)
#For successful knitting of document in pdf:
#tinytex::install_tinytex()
#read data set Tweets May 16, 2020: Covid related hastags as per project document.
getwd()
```

## [1] "C:/Ryerson University - Capstone project/Module 2/EIEEE - Large dataset/Combined"

```
data_set_may <- read.csv("corona_tweets_59 May 2020", header = T, sep = ",")</pre>
## Warning in scan(file = file, what = what, sep = sep, quote = quote, dec = dec, :
## embedded nul(s) found in input
#take a sample of 1,000, set seed to replicate results across several analysis of methods:
set.seed(1000)
rawData <- data_set_may[sample(nrow(data_set_may), size = 1000), ]</pre>
#str(rawData)
#Add column id to line up with lab script and transform file to format appropriate for corpus
rawData$id <- 1:nrow(rawData)</pre>
#str(rawData)
# replace header "text" to "transcript" to line up with lab script
rawData$transcript <- rawData$text</pre>
#str(rawData)
numberofDocs <- length(rawData$id)</pre>
rawData$id <- paste0("Doc", c(1:numberofDocs))</pre>
#str(rawData)
#set of Corpus using VectorSource() and VCorpus
listofDocs <- tm::VectorSource(rawData$transcript)</pre>
listofDocs$Names <- names(rawData$id)</pre>
corporaData <- tm::VCorpus(listofDocs)</pre>
#use VCorpus as it allows for customized tokenization required for n-gram analysis later on in the code
#Lemmatization is the process of reducing a word to its base form while incorporating information about
#Utilizing Thesaurus: lexicon
for(i in 1:1000)
    corporaData[[i]]$content <-</pre>
    textstem::lemmatize_strings(corporaData[[i]]$content,
                                 dictionary = lexicon::hash_lemmas)
}
#Stemming removes a word's suffix (ending), such as es, s, ing, ed, y, based on an heuristic algorithm.
corporaData <- tm::tm_map(corporaData, stemDocument)</pre>
#COULDN'T RESOLVE KNITTING ERROR: error in match.fun(FUN) : object 'stemdocument' not found
#remove words that don't add to context of Tweet, but more so are terms that don't distinguish well bet
#Stopword Removal
corporaData <- tm::tm_map(corporaData, removeWords, stopwords('english'))</pre>
corporaData <- tm::tm_map(corporaData, removeWords, stopwords('SMART'))</pre>
```

```
## Warning: 'stopwords(language = "SMART")' is deprecated.
## Use 'stopwords(source = "smart")' instead.
## See help("Deprecated")
#Other Pre-processing Steps: Punctuation Marks, Extra Whitespaces, etc
corporaData <- tm::tm_map(corporaData, content_transformer(tolower))</pre>
corporaData <- tm::tm_map(corporaData, removePunctuation,</pre>
                     ucp = TRUE,
                     preserve_intra_word_contractions = FALSE,
                     preserve_intra_word_dashes = FALSE)
corporaData <- tm::tm_map(corporaData, removeNumbers)</pre>
corporaData <- tm::tm_map(corporaData, stripWhitespace)</pre>
corporaData[[1]]$content
## [1] "mani american prove dilig stay home limit spread covid but accept social distanc wane https diq
# Create a uni-gram Term Document Matrix, #output shows terms for document 1 and frequency in other doc
#output doesn't look right to me, there is something not right with the preprocessed corpus
term.doc.matrix.1g <- tm::TermDocumentMatrix(corporaData)</pre>
tm::inspect(term.doc.matrix.1g[1:10,1:10])
## <<TermDocumentMatrix (terms: 10, documents: 10)>>
## Non-/sparse entries: 0/100
## Sparsity
## Maximal term length: 9
## Weighting
                  : term frequency (tf)
## Sample
##
                  Docs
## Terms
                  1 2 3 4 5 6 7 8 9 10
##
    $bscuney
                  0000000000
                   0 0 0 0 0 0 0 0 0
##
    łðÿ
##
    ¥workplac
                 0000000000
##
    \200ðÿ\230
                         0000000000
                   0 0 0 0 0 0 0 0 0
##
    +cruis
                   0000000000
##
    +ve
##
                   0000000000
    ٦ðÿ
                   0 0 0 0 0 0 0 0 0
##
    ®ðÿ
##
    \217ðÿ
                      0000000000
##
                         0 0 0 0 0 0 0 0 0
    \215ðÿ\217
# Represent TDM in a matrix format and display its dimensions. Output shows for each term in every doc,
term.doc.matrix.unigram <- as.matrix(term.doc.matrix.1g)</pre>
dim(term.doc.matrix.unigram)
## [1] 5569 1000
#head(term.doc.matrix.unigram)
```

```
# Create a bi-gram Term Document Matrix
tokenizer <- function(x) RWeka::NGramTokenizer(x, RWeka::Weka_control(min=2, max=2))</pre>
term.doc.matrix.2g <- tm::TermDocumentMatrix(corporaData, control = list(tokenize=tokenizer))</pre>
tm::inspect(term.doc.matrix.2g[1:10,1:10])
## <<TermDocumentMatrix (terms: 10, documents: 10)>>
## Non-/sparse entries: 0/100
## Sparsity
                    : 100%
## Maximal term length: 13
## Weighting
             : term frequency (tf)
## Sample
##
                 Docs
                1 2 3 4 5 6 7 8 9 10
## Terms
    $ broadway 0 0 0 0 0 0 0 0 0 0
##
   $ child 0 0 0 0 0 0 0 0 0
##
## $ covid
                0000000000
   $ feder 0 0 0 0 0 0 0 0 0
##
   $ household 0 0 0 0 0 0 0 0 0
##
              0 0 0 0 0 0 0 0 0
##
    $ k
## $ million 0 0 0 0 0 0 0 0 0
##
   $ reptil
                0000000000
    ##
    $bscuney lose 0 0 0 0 0 0 0 0 0
# Represent TDM in a matrix format and display its dimensions
term.doc.matrix.bigram <- as.matrix(term.doc.matrix.2g)</pre>
dim(term.doc.matrix.bigram)
## [1] 13872 1000
#head(term.doc.matrix.bigram)
#Getting error: subscript out of bounds?? results in zero terms out of 1000 documents
# Reduce the dimension of the TDM uni-gram matrix
term.doc.matrix.1g <- tm::removeSparseTerms(term.doc.matrix.1g, 0.8)</pre>
#tm::inspect(term.doc.matrix.1g[1:10,1:10])
# Represent the TDM as a regular matrix
#term.doc.matrix.unigram <- as.matrix(term.doc.matrix.1g)</pre>
#dim(term.doc.matrix.unigram)
#head(term.doc.matrix.unigram)
#Getting error: subscript out of bounds?? results in zero terms out of 1000 documents
# Reduce the dimension of the TDM bi-gram matrix
term.doc.matrix.2g <- tm::removeSparseTerms(term.doc.matrix.2g, 0.8)</pre>
#tm::inspect(term.doc.matrix.2g[1:10,1:10])
# Represent the TDM as a regular matrix
#term.doc.matrix.bigram <- as.matrix(term.doc.matrix.2g)</pre>
#dim(term.doc.matrix.bigram)
#head(term.doc.matrix.bigram)
```

```
#Normalization
# Declaring weights (TF-IDF variants)
tf.idf.weights <- function(tf.vec) {</pre>
# Computes tfidf weights from term frequency vector
  n.docs <- length(tf.vec)</pre>
  doc.frequency <- length(tf.vec[tf.vec > 0])
  weights <- rep(0, length(tf.vec))</pre>
  relative.frequency <- tf.vec[tf.vec > 0] / sum(tf.vec[tf.vec > 0])
  weights[tf.vec > 0] <- relative.frequency *</pre>
  log10(1 + n.docs/doc.frequency)
  return(weights)
}
#Compute the TF-IDF (unigram)
tfidf.matrix.uni <- t(apply(as.matrix(term.doc.matrix.unigram), 1,</pre>
FUN = function(row) {tf.idf.weights(row)}))
colnames(tfidf.matrix.uni) <- rawData$id</pre>
#head(tfidf.matrix.uni)
dim(tfidf.matrix.uni)
## [1] 5569 1000
#Compute the TF-IDF (bigram)
tfidf.matrix.bi <- t(apply(as.matrix(term.doc.matrix.bigram), 1,
FUN = function(row) {tf.idf.weights(row)}))
colnames(tfidf.matrix.bi) <- rawData$id</pre>
\#head(tfidf.matrix.bi)
dim(tfidf.matrix.bi)
## [1] 13872 1000
\# index ranges 0 to 1 where 1 means exactly the same and lesser values indicate high, intermediate or l
#Compute Cosine Similarity indices for the uni-gram TDM
c.similarity.matrix.uni <-</pre>
text2vec::sim2(t(tfidf.matrix.uni), method = 'cosine')
#Compute Cosine Similarity Indices for the bi-gram TDM
c.similarity.matrix.bi <-</pre>
text2vec::sim2(t(tfidf.matrix.bi), method = 'cosine')
#Display Ranked Lists for last tweet in sample
sort(c.similarity.matrix.uni[1000, ], decreasing = TRUE)[1:1000]
        Doc1000
                                                                            Doc852
##
                       Doc66
                                    Doc249
                                                 Doc863
                                                               Doc521
## 1.000000e+00 5.514006e-02 6.580743e-03 6.542373e-03 4.314750e-03 4.239623e-03
##
         Doc375
                      Doc613
                                   Doc204
                                                 Doc319
                                                               Doc827
                                                                            Doc254
## 3.669922e-03 3.001138e-03 2.258314e-03 6.726797e-04 6.726797e-04 4.353545e-04
         Doc517
                      Doc924
                                   Doc310
                                                 Doc990
                                                               Doc548
                                                                            Doc605
## 4.353545e-04 4.353545e-04 4.122757e-04 4.122757e-04 3.762658e-04 3.473827e-04
##
        Doc242
                       Doc1
                                  Doc826
                                                Doc149
                                                              Doc250
                                                                           Doc231
```

```
## 2.956028e-04 2.905642e-04 2.831963e-04 2.562009e-04 2.402550e-04 2.338094e-04
                     Doc640
                                  Doc112
                                              Doc460
        Doc859
                                                            Doc718
## 2.280266e-04 2.262618e-04 2.165692e-04 2.129159e-04 2.127279e-04 2.113713e-04
        Doc282
                     Doc358
                                  Doc803
                                              Doc809
                                                            Doc851
## 1.987172e-04 1.951749e-04 1.777768e-04 1.735612e-04 1.647821e-04 1.573340e-04
                     Doc464
                                  Doc714
                                              Doc931
                                                            Doc227
        Doc973
## 1.573340e-04 1.416437e-04 1.402924e-04 1.372452e-04 1.346385e-04 1.346385e-04
        Doc615
                     Doc710
                                  Doc874
                                              Doc984
                                                            Doc505
## 1.346385e-04 1.346385e-04 1.346385e-04 1.346385e-04 1.314499e-04 1.230784e-04
                                  Doc900
        Doc523
                     Doc269
                                              Doc538
                                                            Doc736
## 1.177220e-04 1.140213e-04 1.059971e-04 1.000675e-04 9.570863e-05 9.531941e-05
                                              Doc105
                     Doc992
                                  Doc74
         Doc24
                                                            Doc961
## 8.857525e-05 8.691518e-05 8.261753e-05 8.216124e-05 7.731465e-05 7.530749e-05
                                  Doc675
                                                              Doc7
        Doc688
                     Doc864
                                              Doc782
## 7.483624e-05 6.982542e-05 6.787843e-05 6.467287e-05 6.331333e-05 6.051159e-05
        Doc823
                      Doc28
                                  Doc299
                                               Doc963
                                                            Doc271
## 5.854631e-05 5.598389e-05 5.598389e-05 5.264303e-05 4.355356e-05 4.355356e-05
                     Doc866
                                  Doc291
                                              Doc155
                                                            Doc491
## 4.256291e-05 4.256291e-05 4.017079e-05 3.940318e-05 3.922173e-05 3.891908e-05
        Doc138
                     Doc408
                                  Doc434
                                            Doc690
                                                            Doc506
## 3.891908e-05 3.799845e-05 3.673523e-05 3.328182e-05 3.272983e-05 3.107495e-05
        Doc948
                     Doc438
                                  Doc27
                                              Doc376
## 2.723674e-05 2.626651e-05 2.571079e-05 2.33288e-05 2.274006e-05 2.248784e-05
                                  Doc368
        Doc775
                      Doc21
                                               Doc719
                                                            Doc729
## 2.231511e-05 2.220811e-05 2.206437e-05 2.206226e-05 2.107747e-05 1.990681e-05
        Doc646
                     Doc993
                                  Doc530
                                                Doc50
                                                             Doc72
## 1.949942e-05 1.946104e-05 1.887686e-05 1.878699e-05 1.875653e-05 1.859861e-05
        Doc622
                     Doc746
                                  Doc551
                                                Doc85
                                                            Doc749
## 1.805497e-05 1.751705e-05 1.731436e-05 1.712519e-05 1.704962e-05 1.702386e-05
        Doc629
                     Doc850
                                  Doc370
                                                Doc46
                                                            Doc892
## 1.646842e-05 1.550898e-05 1.526128e-05 1.502580e-05 1.502455e-05 1.460340e-05
        Doc699
                     Doc936
                                   Doc75
                                               Doc379
                                                             Doc55
## 1.433207e-05 1.420610e-05 1.261430e-05 1.201417e-05 4.866673e-08 4.866673e-08
                                  Doc336
                                               Doc511
        Doc482
                     Doc890
                                                            Doc262
                                                                         Doc273
## 4.866673e-08 4.866673e-08 4.254761e-08 4.254761e-08 3.970097e-08 3.970097e-08
                     Doc999
        Doc983
                                  Doc135
                                              Doc490
                                                            Doc595
## 3.970097e-08 3.970097e-08 3.606198e-08 3.606198e-08 3.606198e-08 3.444966e-08
        Doc202
                     Doc157
                                  Doc187
                                              Doc614
                                                            Doc175
## 3.444966e-08 3.011157e-08 3.011157e-08 3.011157e-08 2.875647e-08 2.875647e-08
                     Doc561
                                  Doc808
                                                Doc84
                                                            Doc395
        Doc875
## 2.875647e-08 2.838417e-08 2.838417e-08 2.816981e-08 2.816981e-08 2.667705e-08
        Doc972
                                  Doc470
                                              Doc998
                                                            Doc326
                     Doc82
## 2.667705e-08 2.591477e-08 2.399810e-08 2.399187e-08 2.388393e-08 2.305832e-08
                     Doc618
                                  Doc248
                                              Doc363
        Doc573
                                                            Doc111
## 2.305300e-08 2.305300e-08 2.299289e-08 2.287413e-08 2.264351e-08 2.227547e-08
                     Doc445
                                                            Doc466
                                   Doc97
                                               Doc762
                                                                         Doc836
        Doc119
## 2.145106e-08 2.145106e-08 2.099629e-08 2.099629e-08 2.086613e-08 2.070760e-08
         Doc87
                     Doc520
                                  Doc114
                                               Doc133
                                                            Doc770
## 2.040477e-08 2.040477e-08 2.026123e-08 2.026123e-08 2.012502e-08 2.012502e-08
        Doc593
                     Doc598
                                  Doc516
                                              Doc456
                                                            Doc311
## 1.959636e-08 1.957277e-08 1.948421e-08 1.947129e-08 1.934270e-08 1.926154e-08
        Doc911
                    Doc539
                                  Doc533
                                              Doc446
                                                            Doc802
## 1.925688e-08 1.924586e-08 1.916107e-08 1.864065e-08 1.843927e-08 1.832374e-08
##
        Doc601
                   Doc278
                                 Doc346
                                               Doc467
                                                          Doc660
```

```
## 1.825313e-08 1.823954e-08 1.823954e-08 1.754153e-08 1.754153e-08 1.746950e-08
                                                Doc986
                                                             Doc700
         Doc448
                      Doc592
                                   Doc687
                                                                            Doc40
## 1.746950e-08 1.743016e-08 1.725427e-08 1.697369e-08 1.696902e-08 1.694516e-08
                      Doc380
                                    Doc60
                                                Doc296
                                                             Doc801
         Doc141
## 1.693940e-08 1.693595e-08 1.693404e-08 1.691810e-08 1.690908e-08 1.690292e-08
         Doc268
                      Doc970
                                   Doc469
                                                Doc873
                                                             Doc140
## 1.689663e-08 1.688656e-08 1.686939e-08 1.686191e-08 1.680047e-08 1.679730e-08
         Doc433
                      Doc142
                                   Doc794
                                                Doc174
                                                             Doc903
## 1.678510e-08 1.676713e-08 1.676210e-08 1.675886e-08 1.674278e-08 1.672235e-08
         Doc716
                      Doc181
                                   Doc410
                                                Doc544
                                                             Doc784
  1.669128e-08 1.667211e-08 1.665124e-08 1.663778e-08 1.661669e-08 1.660526e-08
                                   Doc301
                                                Doc462
         Doc284
                      Doc136
                                                             Doc178
                                                                           Doc686
  1.658708e-08 1.655602e-08 1.655333e-08 1.653704e-08 1.652325e-08 1.649500e-08
         Doc304
                      Doc879
                                   Doc128
                                                Doc125
                                                             Doc361
## 1.648790e-08 1.648464e-08 1.640790e-08 1.639808e-08 1.638696e-08 1.638013e-08
         Doc704
                      Doc843
                                    Doc48
                                                Doc137
                                                             Doc910
## 1.636856e-08 1.636856e-08 1.636331e-08 1.634367e-08 1.634367e-08 1.631325e-08
         Doc265
                      Doc789
                                   Doc429
                                                Doc946
                                                             Doc124
## 1.629705e-08 1.622732e-08 1.622200e-08 1.617447e-08 1.608670e-08 1.607461e-08
        Doc351
                      Doc654
                                    Doc23
                                                Doc152
                                                             Doc787
## 1.605413e-08 1.604201e-08 1.603274e-08 1.600189e-08 1.586891e-08 1.585757e-08
                      Doc148
                                    Doc22
                                                Doc207
## 1.575528e-08 1.571925e-08 1.569076e-08 1.552050e-08 1.552050e-08 1.547666e-08
                                   Doc761
                      Doc528
                                                Doc953
## 1.545882e-08 1.538984e-08 1.538013e-08 1.537468e-08 1.532429e-08 1.531134e-08
        Doc741
                      Doc171
                                  Doc976
                                               Doc846
                                                             Doc453
## 1.526017e-08 1.522813e-08 1.522548e-08 1.516492e-08 1.514826e-08 1.505061e-08
        Doc712
                       Doc92
                                   Doc996
                                                Doc844
                                                             Doc860
## 1.501684e-08 1.498464e-08 1.498464e-08 1.497721e-08 1.485249e-08 1.476782e-08
        Doc647
                      Doc163
                                   Doc638
                                                Doc898
                                                             Doc555
## 1.474699e-08 1.474311e-08 1.458456e-08 1.443607e-08 1.443126e-08 1.432069e-08
         Doc723
                      Doc303
                                   Doc236
                                                Doc535
                                                             Doc384
                                                                           Doc776
## 1.429538e-08 1.427373e-08 1.426274e-08 1.423720e-08 1.421218e-08 1.397335e-08
                                   Doc842
        Doc725
                      Doc881
                                                Doc847
                                                             Doc913
                                                                           Doc334
## 1.388227e-08 1.385896e-08 1.368790e-08 1.364422e-08 1.360424e-08 1.356294e-08
                      Doc960
                                   Doc989
        Doc822
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## 0.000000e+00 0.000000e+00 0.000000e+00 0.000000e+00
```

sort(c.similarity.matrix.bi[1000, ], decreasing = TRUE)[1:1000]

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     Doc791
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           Doc163
              Doc164
     Doc161
```

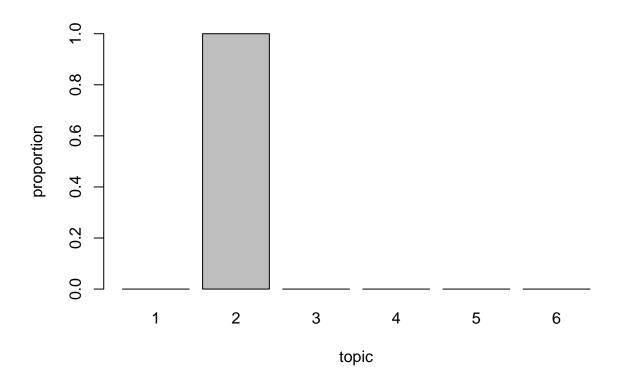
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                                    Doc 999
#heatmap not informative, too many datapoints
#heatmap(c.similarity.matrix.uni[, ])
#heatmap(c.similarity.matrix.bi[, ])
#pairheatmap(c.similarity.matrix.uni[,], c.similarity.matrix.bi[,], colorStyle="s3")
#LDA - topic relevance
dtm = as(term.doc.matrix.bigram, "dgTMatrix")
lda_model = text2vec::LDA$new(n_topics = 6, doc_topic_prior = 0.1, topic_word_prior = 0.01)
doc_topic_distr = lda_model$fit_transform(x = dtm, n_iter = 1000,
               convergence tol = 0.001, n check convergence = 25,
               progressbar = TRUE)
##
  1
#plotting results
barplot(doc_topic_distr[1, ], xlab = "topic",
    ylab = "proportion", ylim = c(0, 1),
    names.arg = 1:ncol(doc_topic_distr))
```



```
lda_model$get_top_words(n = 6, topic_number = c(1L, 3L, 6L), lambda = 1)
##
        [,1]
             [,2] [,3]
## [1,] "93" "963" "277"
## [2,] "861" "85" "711"
## [3,] "936" "235" "334"
## [4,] "263" "606" "564"
## [5,] "742" "409" "947"
## [6,] "113" "637" "53"
lda_model$get_top_words(n = 6, topic_number = c(1L, 3L, 6L), lambda = 0.2)
              [,2] [,3]
##
        [,1]
## [1,] "93"
             "963" "277"
## [2,] "861" "85" "711"
## [3,] "263" "235" "564"
## [4,] "742" "606" "947"
## [5,] "113" "409" "53"
## [6,] "220" "637" "374"
lda_model$plot()
```

## Loading required namespace: servr